

# CFSv2 Reforecasts: Where is the Observation in the Forecast Ensemble Space?



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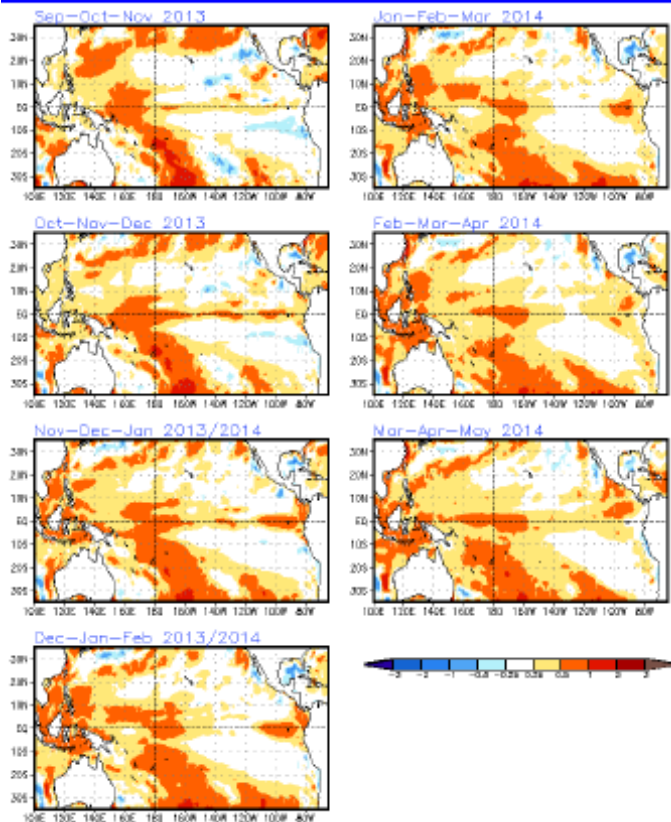
# Overview

- ☐ **Motivation and Objective**
- ☐ **Anomaly Calculations**
- ☐ **Systematic errors**
- ☐ **Answer to the title question**
- ☐ **Seasonality in Forecast spread**
- ☐ **Conclusions**

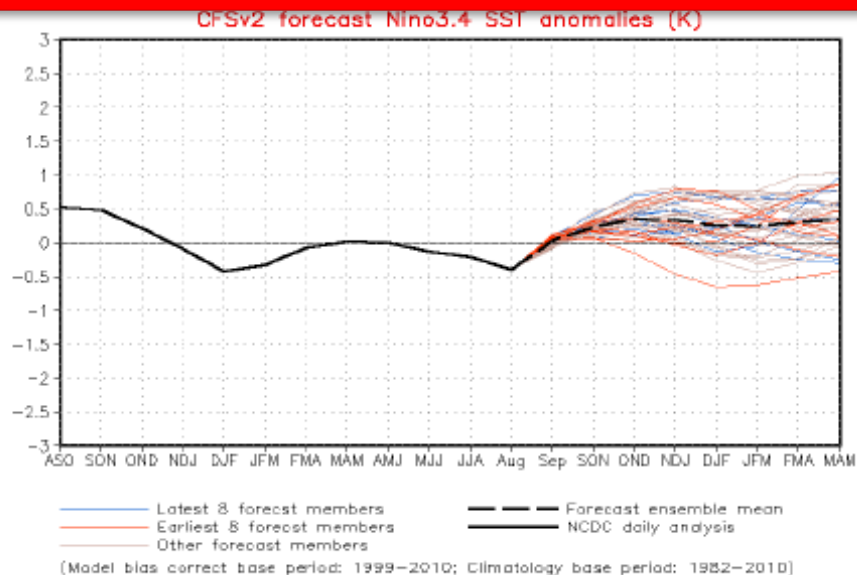
# Motivation: 2014 ENSO Forecast



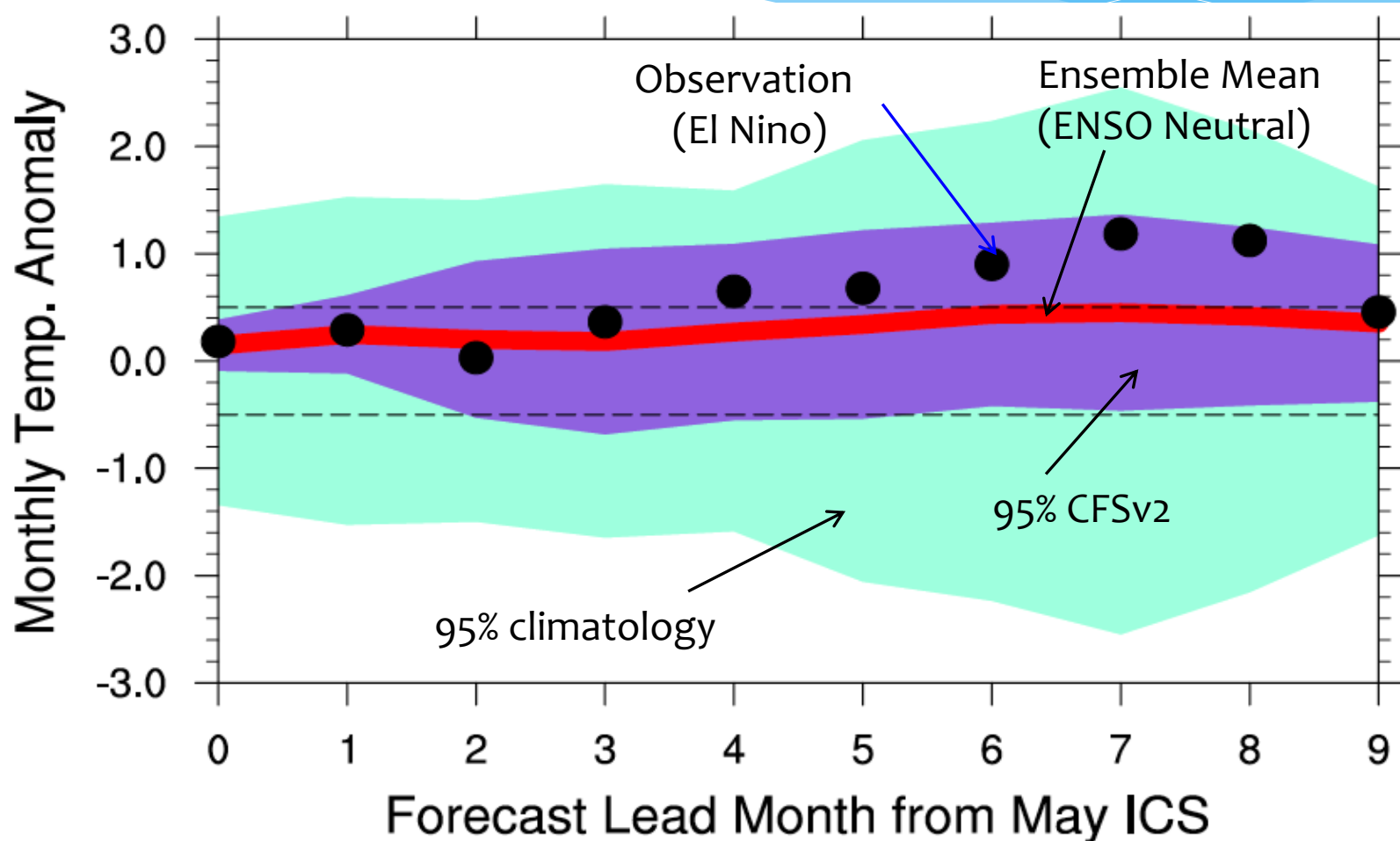
## SST Outlook: NCEP CFS.v2 Forecast Issued 8 September 2013



The CFS.v2 ensemble mean (black dashed line) predicts ENSO-neutral conditions into early 2014.

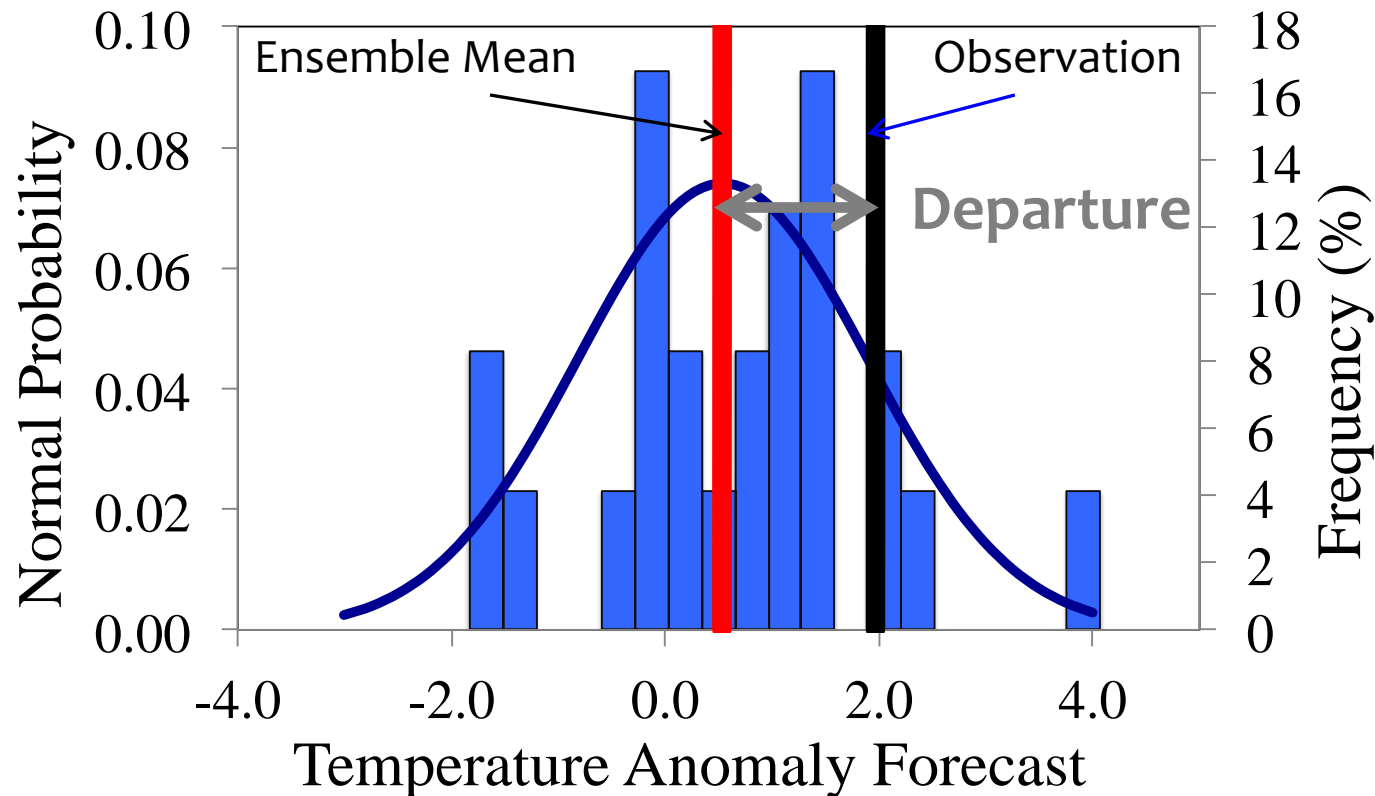


# Motivation: 2006 ENSO Forecast



24-member SST anomaly forecast in Niño3.4 region  
using May initial conditions in 2006

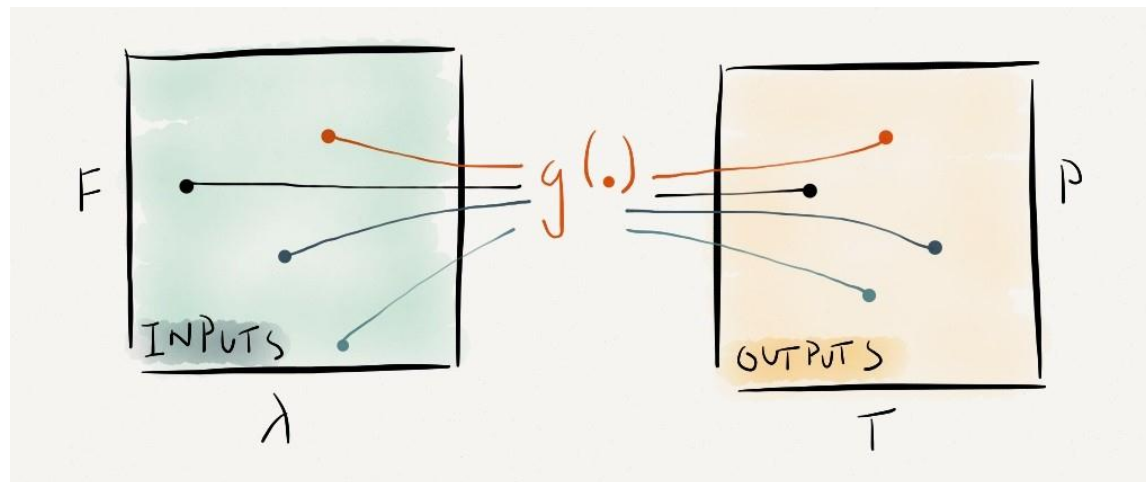
# Objective: Quantify departure of ensemble mean from observation



Two Month Lead (July, 2006) Temperature Forecast in the Midwestern United States using May 2006 initial condition

# Perfect Model Framework

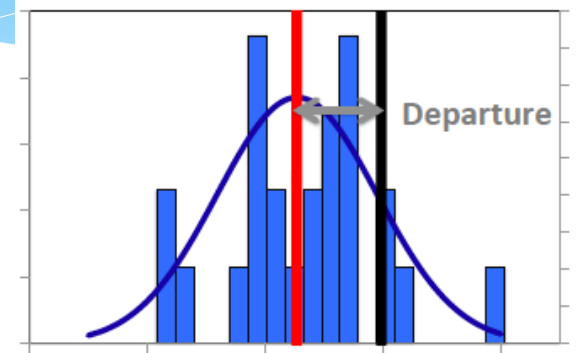
- Observations => CFSv2 Reanalysis data
- No issue of observational uncertainties and deficiency in model parameterization
- Gives an upper bound of predictability in the climate system



# Anomaly Calculations

## 1. Absolute Departure (AD)

$$AD_{m,l,y} = \frac{\text{abs} \left( \frac{1}{n} \sum_{i=1}^n f_{i,m,l,y} - O_{m,l,y} \right)}{\sigma_{m,l,y}}$$



Forecast ( $f$ ,  $n$  ensembles) initialized in month ( $m$ ) and year ( $y$ ) verified at lead month ( $l$ ) against observation of the corresponding month ( $O_{m,l,y}$ ).  $\sigma_{m,l,y}$  is one standard deviation ensemble spread

## 2. Absolute Anomaly Departure (AAD)

$$AAD_{m,l,y} = \frac{\text{abs} \left( \frac{1}{n} \sum_{i=1}^n fA_{i,m,l,y} - OA_{m,l,y} \right)}{\sigma_{m,l,y}}$$

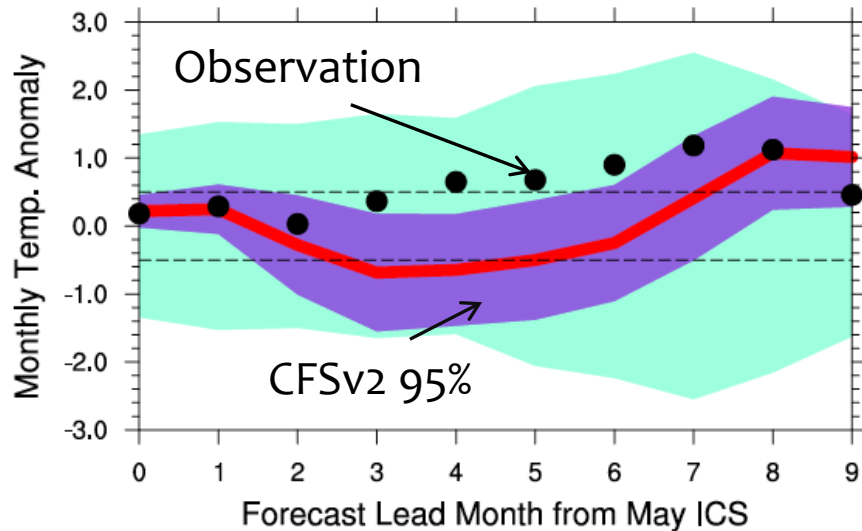
$$fA_{i,m,l,y} = f_{i,m,l,y} - \frac{1}{p} \sum_{y=1}^p \frac{1}{n} \sum_{i=1}^n f_{i,m,l,y}$$

$$OA_{m,l,y} = O_{m,l,y} - \frac{1}{p} \sum_{y=1}^p (o_{m,l,y})$$

$P$  is total number of years for which reforecasts are available (1982 to 2009)

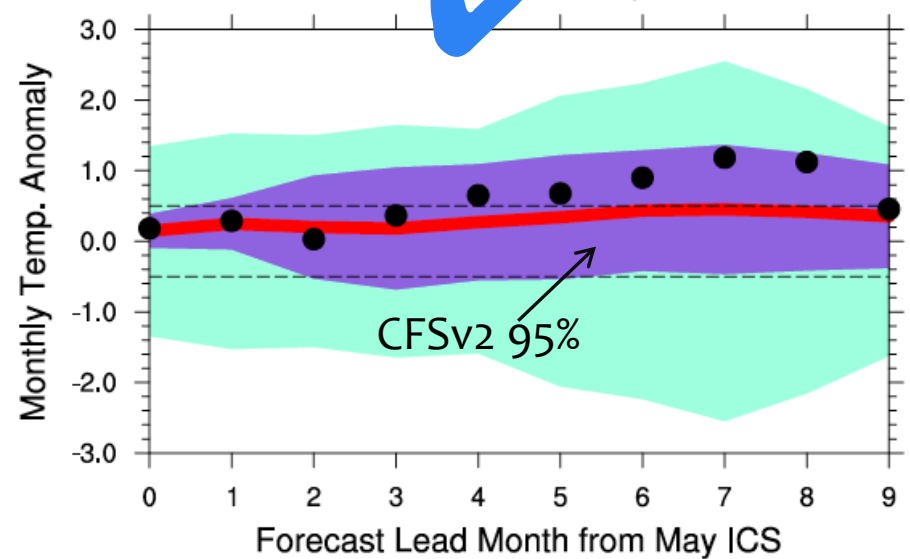
# AD versus AAD Forecast

## AD type forecast



4 out of 9 observations are outside 95% range

## AAD type forecast



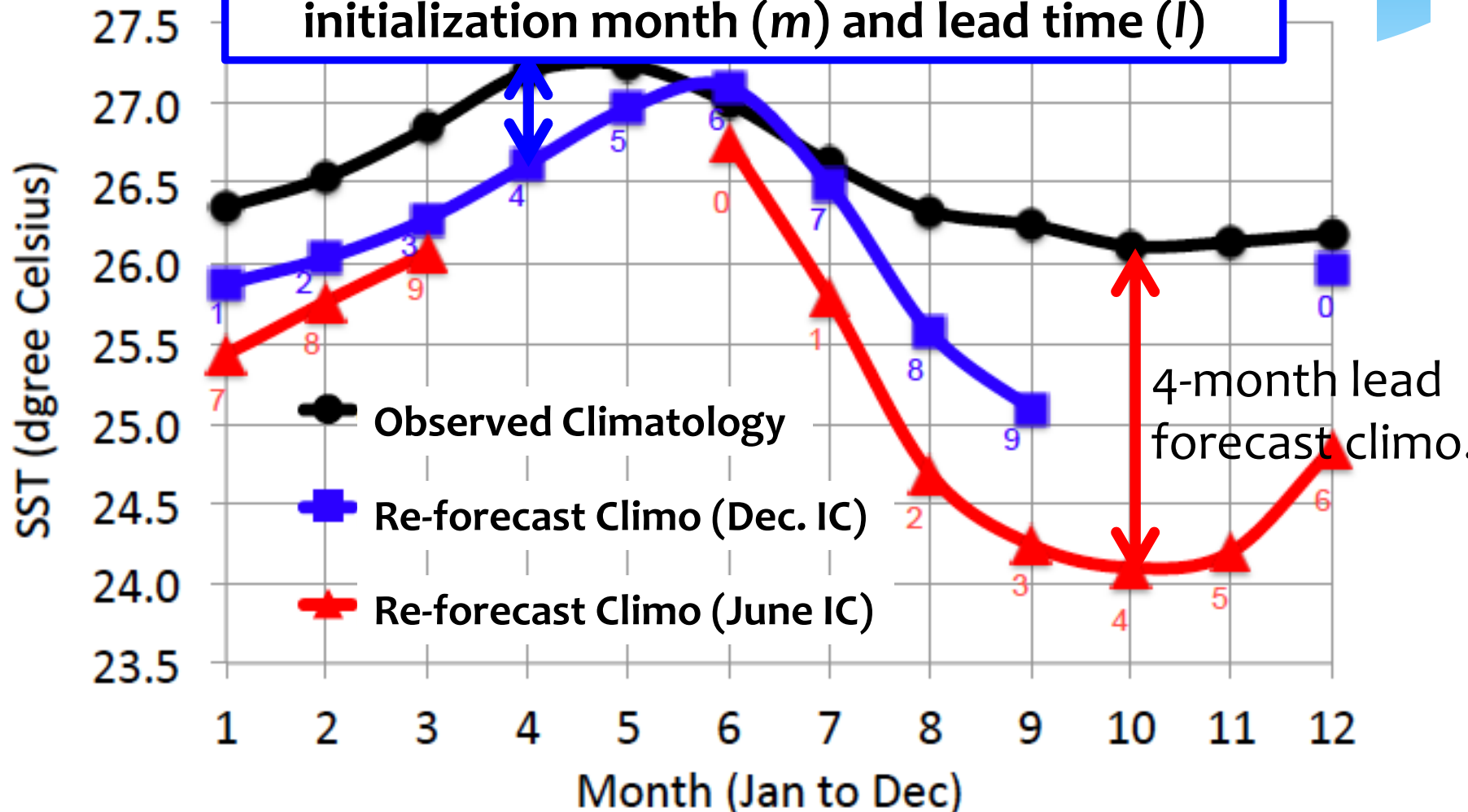
All 9 observations are within 95% range

24-member (n) SST anomaly forecast in Nino3.4 region using May (m) initial conditions in 2006 (y)



# Systematic Error

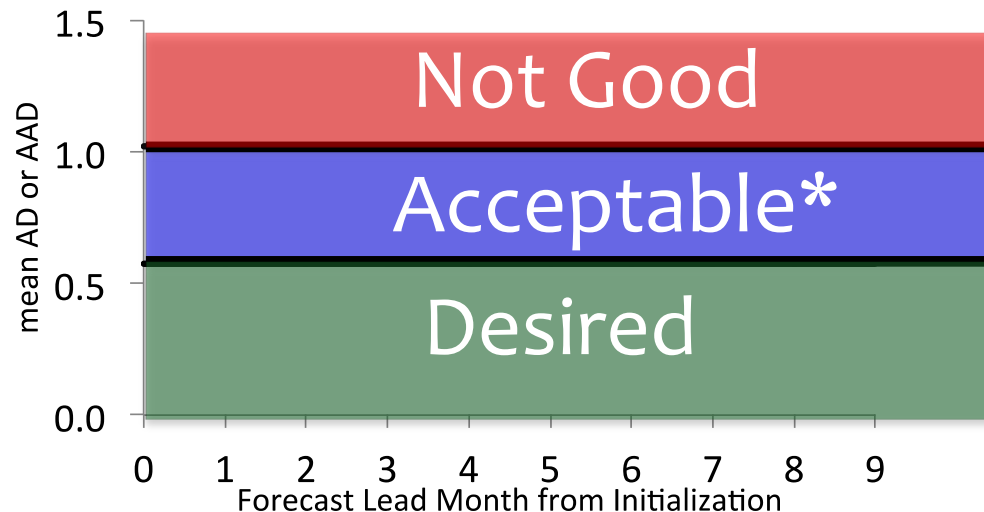
A Unique Combination of forecast initialization month ( $m$ ) and lead time ( $l$ )



SST Climatology in Nino3.4 region

# Statistical Inference of Anomaly Calculations

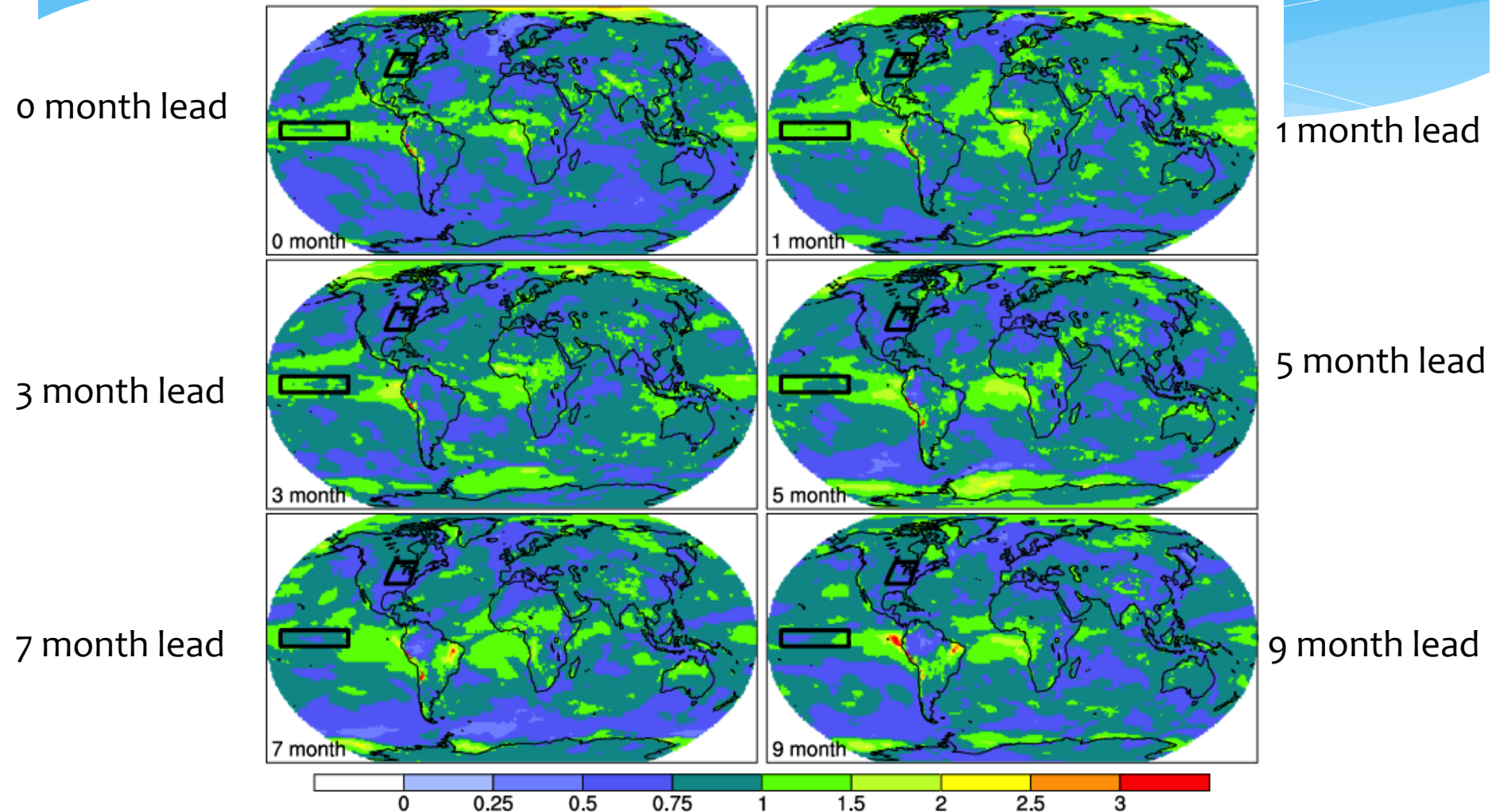
- $y = \text{AD or AAD}$ ,  $y = 0$  indicates observation = ensemble mean (desired outcome). For any other values  $y$  always increases
- Null Hypothesis ( $H_0$ ): Observation is randomly distributed around the ensemble mean (white noise:  $\mu = 0$ ,  $\sigma = 1$ )
- From standard method,  $y$  is a half normal distribution with  $\mu = 0.80$  and  $\sigma = 0.60$ . Hence 95% confidence interval for hypothesis testing can be constructed using test statistics  $\overline{y}$



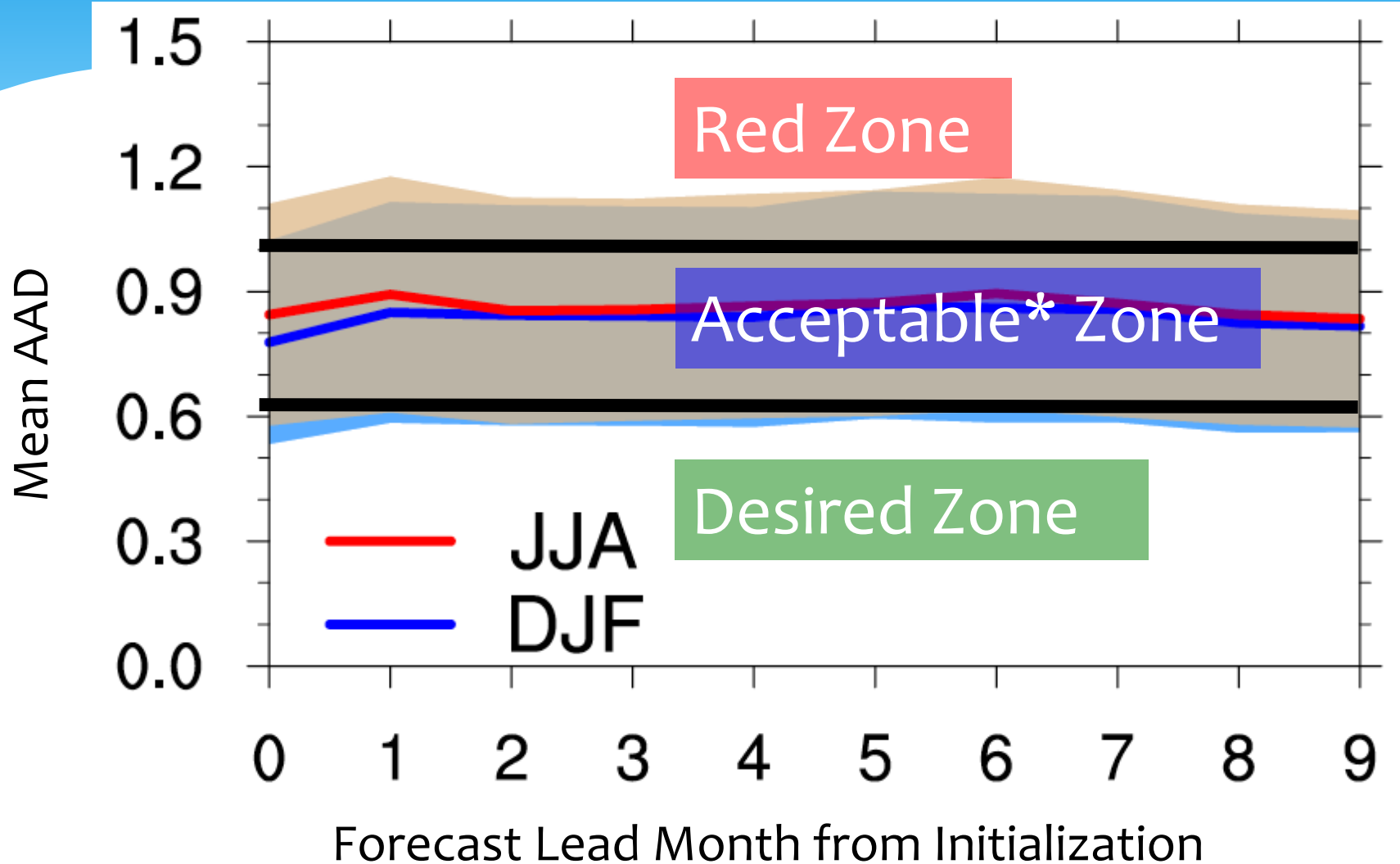
\* Provided forecast also mentions about ensemble spread in addition to ensemble mean (a two parameter model)

# Results: mean AAD for near surface air temperature (1982 to 2008)

Average of forecast initialized in JJA months

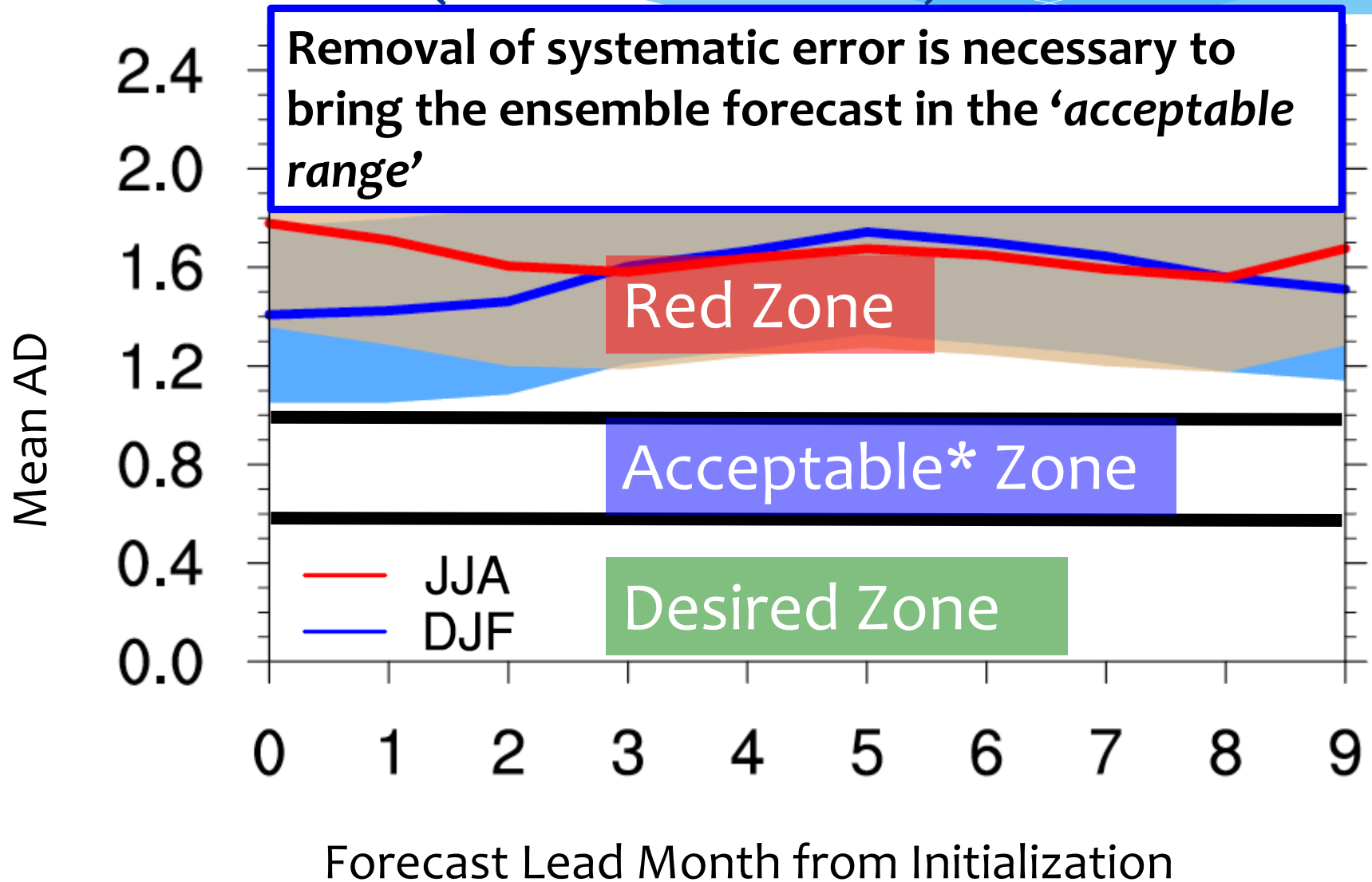


# Global Land average mean AAD for near surface air temperature (1982 to 2008)



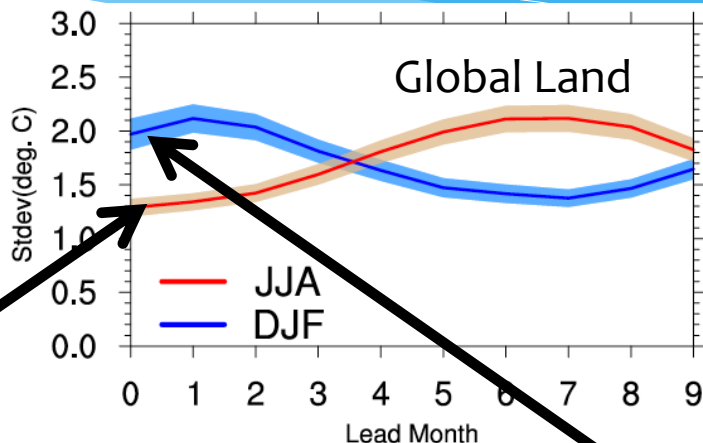
# Difference between AD and AAD

(same as last slide for AD)

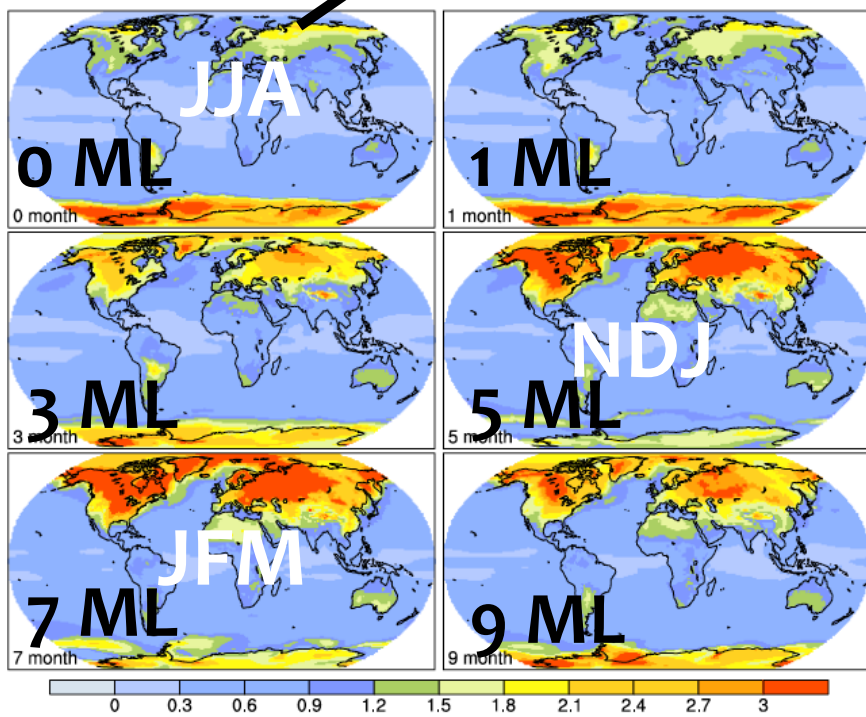


# Seasonality in forecast standard deviation

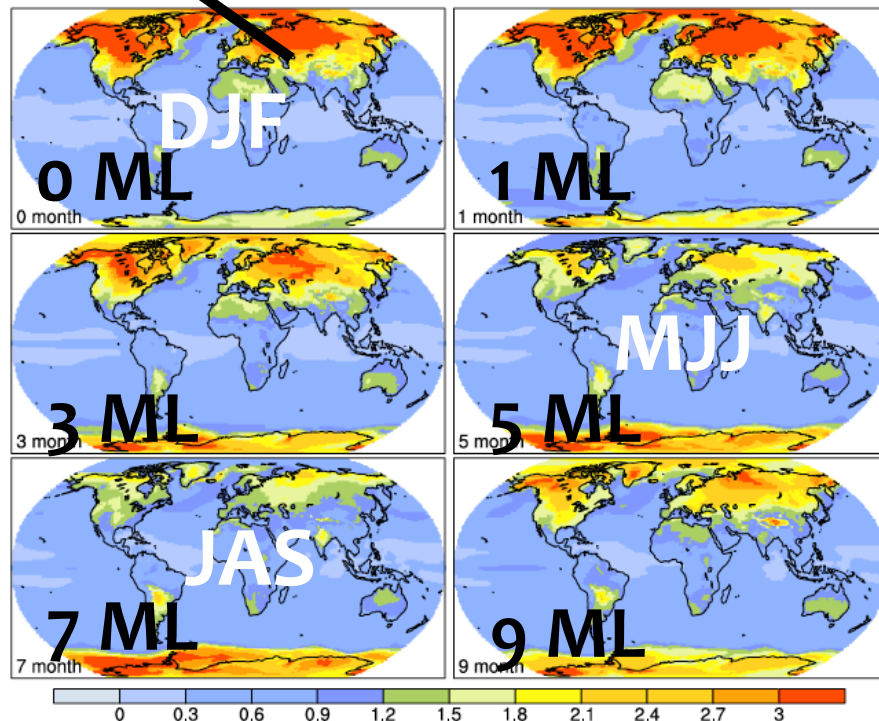
Forecast standard deviation across 24 members, averaged for 1982 to 2008



ML – Month Lead



Forecast initialized in JJA



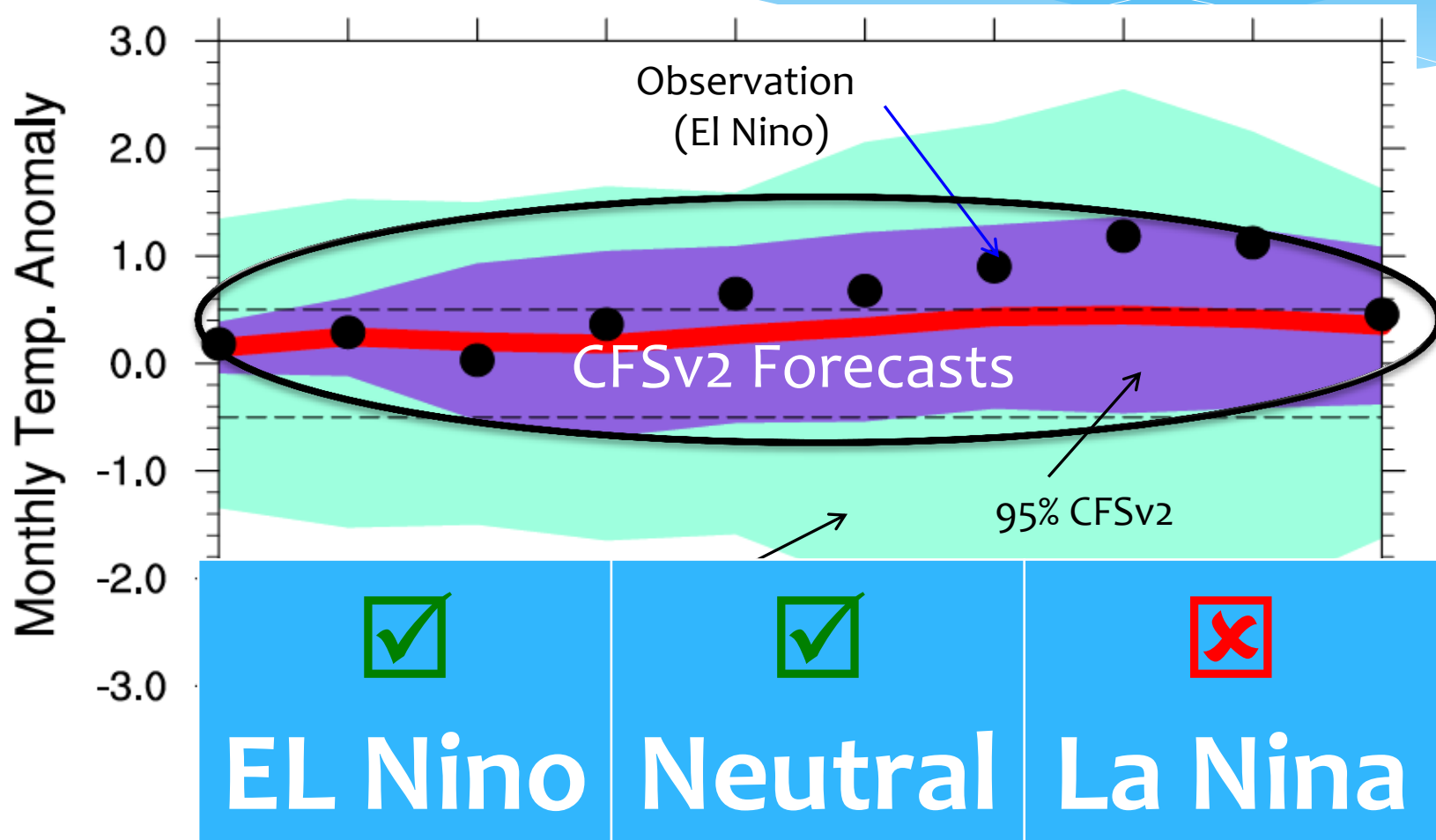
Forecast initialized in DJF



# Conclusion

1. Removal of Systematic Error, a function of forecast initialization month and lead time, is necessary to bring the forecast in “the acceptable range”
2. Observations are randomly distributed around ensemble mean: a white noise with mean = 0, and standard deviation = ensemble standard deviation (H<sub>0</sub> is not rejected)
3. CFSv2 provides useful ensemble forecasts (mean and standard deviation) at all forecasts lead (0 to 9 months).

# Recommendation



24-member SST anomaly forecast in Nino3.4 region  
using May initial conditions in 2006